

WHAT IS CLAIMED IS:

1. A computer-implemented process for segmenting image data,
comprising the process actions of:

5 inputting an image;

segmenting said image using a mean shift segmentation technique
employing anisotropic kernels.

2. The computer-implemented process of Claim 1 wherein the
10 anisotropic kernels comprise a spatial/lattice component and a space dependent
range/color domain component.

3. The computer-implemented process of Claim 1 wherein the
anisotropic kernels comprise a spatial/lattice component and a range/color
15 domain component that is not space dependent.

4. The computer-implemented process of Claim 1 wherein
segmenting said image comprises:

initializing kernel data;

20 for each of a set of feature points, determining an anisotropic kernel with a
spatial component and a related color component;

associating a mean shift point with every feature point and initializing said
mean shift point to coincide with that feature point;

updating mean shift points by iterative anisotropic mean shift updates; and

merging vectors associated with feature points that are approximately the same to produce homogeneous color regions.

5 5. The computer-implemented process of Claim 4 wherein initializing the kernel data comprises the process actions of:

transferring pixels of said image into multi-dimensional feature points, x_i ;

specifying an initial spatial domain parameter h_0^S and an initial range domain parameter h_0^r ;

associating kernels with said feature points;

10 initializing means of kernels as the value of said feature points associated with kernels; and

setting initial kernel bandwidth matrices in the spatial/lattice domain as the diagonal matrix $H_i^S = (h_0^S)^2 I$ and in the range/color domain setting $h^r(H_i^S) = h_0^r$, where I is the identity matrix.

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6. The computer-implemented process of Claim 4, wherein for each of a set of feature points, determining an anisotropic kernel with a spatial/lattice component and a related range/color component, comprising the process actions of:

20 for each feature point x_i , searching the neighbors of said feature point x_j , $j=1, \dots, n$ to obtain all feature points that satisfy the constraints of the kernels;

iteratively updating a bandwidth matrix of the anisotropic kernel in the spatial domain,

modulating the bandwidth of the anisotropic kernel in the spatial domain;
and
modulating the color tolerance of the related color component.

- 5 7. The computer-implemented process of Claim 6 wherein the constraints of kernels are defined by:

$$k^2(g((x_i, x_j, H_i^S)) < 1; k^r \left\| \frac{x_i - x_j}{h^r(H_i^S)} \right\|^2 < 1$$

where H_i^S is the spatial/lattice bandwidth matrix and h^r is the range/color bandwidth parameter.

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8. The computer-implemented process of Claim 6 wherein the bandwidth matrix H_i^S is updated as:

$$H_i^S \leftarrow \frac{\sum_{j=1}^n \left\| \frac{x_i^r - x_j^r}{h^r(H_i^S)} \right\|^2 (x_j^s - x_i^s)(x_i^s - x_j^s)^T}{\sum_{j=1}^n \left\| \frac{x_i^r - x_j^r}{h^r(H_i^S)} \right\|^2} .$$

- 15 9. The computer-implemented process of Claim 8 wherein the range/color bandwidth parameter $h^r(H_i^S)$ is updated as:

$$h^r(H_i^S) \leftarrow \sqrt{\frac{\lambda'}{\lambda}} \cdot h^r(H_i^S)$$

10. The computer-implemented process of Claim 6 wherein the segmentation is a single image segmentation and wherein modulations are applied to exaggerate eccentricity and modify scale.

5 11. The computer-implemented process of Claim 6 wherein the segmentation is video segmentation and wherein modulations are applied for exaggerating eccentricity, scaling static segments, and overall scale.

12. The computer-implemented process of Claim 4, wherein updating
10 the mean shift points by iterative anisotropic mean shift updates, comprises the process actions of:

for each mean shift point $M(x_i)$,

determining the neighboring feature points x_i ;

calculating a mean shift vector $M(x_i)$ summing over all the

15 neighboring mean shift points; and

updating the mean shift points;

until the change in the mean shift points is less than a specified amount.

13. The computer-implemented process of Claim 12 wherein the mean
20 shift vector is calculated as:

$$M_v(x_i) = \frac{\sum_{j=1}^n (x_j - M(x_i)) \left\| \frac{M(x_i') - x_j'}{h'(H_j^s)} \right\|^2}{\sum_{j=1}^n \left\| \frac{M(x_i') - x_j'}{h'(H_j^s)} \right\|^2}.$$

14. A system for segmenting image data, comprising:
defining an anisotropic kernel of influence for each pixel in an image,
wherein said kernel defines a measure of intuitive distance between pixels,
5 where distance encompasses both spatial/lattice and range/color distance; and
assigning to each pixel a mean shift point initialized to coincide with said
pixel;
iteratively moving each mean shift point upwards along the gradient of the
kernel density function defined by the sum of all the kernels until they reach a
10 stationary point; and
considering pixels that are associated with the set of mean shift points that
migrate to the approximately same stationary point to be members of a single
segment.
15. The system of Claim 14, further comprising:
combining neighboring segments.
16. The system of Claim 14, further comprising eliminating segments
that contain less than a specified number of pixels.
- 20 17. The system of Claim 14 wherein the image is a portion of video
data and wherein distance further comprises temporal distance.

18. A computer-readable medium having computer executable instructions for segmenting image data, said computer executable instructions comprising:

inputting image data; and

5 segmenting said image data using a mean shift segmentation technique employing generally elliptical kernels wherein the computer-executable instruction for segmenting said image data comprises sub-instructions for:

initializing kernel data;

for each feature point, determining a kernel being a product of kernels with
10 at least one of these kernels being elliptical;

associating a mean shift point with every feature point and initializing said mean shift point to coincide with that feature point;

updating mean shift points by an iterative anisotropic mean shift update;
and

15 merging vectors associated with feature points that are approximately the same to produce homogeneous color regions.

19. The computer-readable medium of Claim 18 wherein an elliptical kernel comprises a spatial component..

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20. The computer-readable medium of Claim 18 wherein a non-elliptical kernel comprises a color domain component..

21. The computer-readable medium of Claim 18 wherein the computer-executable instruction for segmenting said image data using a mean shift segmentation technique, comprises a sub-instruction for defining the shape of a elliptical kernel as λDAD^T where λ defines the overall volume of the kernel, A defines the relative lengths of the axes, and D is a rotation matrix that orients the
5 kernel in space and time.

22. The computer-readable medium of Claim 21 wherein the computer-executable instruction for segmenting said image data using a mean shift
10 segmentation technique, further comprises a sub-instruction to modify the shape of an elliptical kernel by varying λ , A or D .

23. The computer-readable medium of Claim 19 wherein the image is a portion of video data and wherein the generally elliptical kernel further comprises
15 a time component.

24. The computer-readable medium of Claim 22 wherein by varying λ the spatial size of the kernel is adjusted.

20 25. The computer-readable medium of Claim 22 wherein by varying A the shape of the kernel is varied.

26. The computer-readable medium of Claim 25 wherein segmentation to segment elongated regions is encouraged by defining A as a diagonal matrix of Eigen values which is normalized to satisfy:

$$\prod_{i=1}^p a_i = 1$$

5 where a_i is the i^{th} diagonal elements of A , and $a_i \geq a_j$, for $i < j$; and wherein the

smaller Eigen values of A are diminished by: $a_i = \begin{cases} a_i^{3/2} & a_i \leq 1 \\ \sqrt{a_i} & a_i > 1 \end{cases}, i = 2, \dots, p$.

27. The computer-readable medium of Claim 25 wherein larger segments for static objects are created by

10 computing a scale factor s_i as

$$s_i = \alpha + (1 - \alpha) \prod_{i=1}^{p-1} d_1(i)^2$$

where d_1 is the first Eigen vector in D , which corresponds with the largest Eigen value a_1 . $d_1(i)$ stands for the i^{th} element in d_1 , which is the x , y and t component of the vector when $i = 1, 2, 3$, respectively, and α is a constant between 0 and 1;

15 setting α to 0.25;

changing A to $a'_i = a_i \cdot s_i, i = 2, \dots, p$;

modifying A as $a_i = \begin{cases} a_i^{3/2} & a_i \leq 1 \\ \sqrt{a_i} & a_i > 1 \end{cases}, i = 2, \dots, p$ or modifying A as

$$s_i = \alpha + (1 - \alpha) \prod_{i=1}^{p-1} d_1(i)^2; \text{ and}$$

changing global scalar λ as

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$$\lambda' = \lambda \prod_{i=1}^p \frac{a_i}{a'_i}.$$

28. The computer-readable medium of Claim 19 wherein said spatial kernel has a constant profile, $k^s(z) = 1$ if $|z| < 1$, and 0 otherwise.

5 29. The computer-readable medium of Claim 20 wherein said color component uses an Epanechnikov kernel with a profile $k^r(z) = 1 - |z|$ if $|z| < 1$ and 0 otherwise.